

Single-Nuclei Analysis of the Unfolded Protein Response (SNUPR): A Novel Method revealing bortezomib resistance mechanisms in Multiple Myeloma

Julien Gigan, Paulina Garcia-Gonzalez, Lou Galliot, Alexandre Reynaud, Yoan Ghaffar, Eve Seillier, Rosario Lavignolle, Felipe Flores, Sharon Fischaux, Daniela Barros dos Santos, et al.

To cite this version:

Julien Gigan, Paulina Garcia-Gonzalez, Lou Galliot, Alexandre Reynaud, Yoan Ghaffar, et al.. Single-Nuclei Analysis of the Unfolded Protein Response (SNUPR): A Novel Method revealing bortezomib resistance mechanisms in Multiple Myeloma. 2024. hal-04791295

HAL Id: hal-04791295 <https://hal.science/hal-04791295v1>

Preprint submitted on 19 Nov 2024

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

"Single-Nuclei Analysis of the Unfolded Protein Response (SNUPR): A Novel Method revealing bortezomib resistance mechanisms in Multiple Myeloma"

Julien P. Gigan¹, Paulina Garcia-Gonzalez¹, Lou Galliot¹, Alexandre Reynaud¹, Yoan Ghaffar¹, Eve Seillier¹, Rosario Lavignolle¹, Felipe Flores¹, Sharon Fischaux¹, Daniela Barros Dos Santos¹, Alexis Combes², Miwako Narita³, Evelina Gatti¹, Beatrice Nal¹, Stéphane Rocchi^{6,7}, Jerome Moreaux⁴, Philippe Pierre^{1,7,8*}, Rafael J. Argüello^{1*}

¹ Aix Marseille Université, CNRS, INSERM, CIML, 13288 Marseille cedex 9, France.

² Department of Pathology, University of California, San Francisco, San Francisco, CA 94143, USA; UCSF CoLabs, University of California, San Francisco, San Francisco, CA 94143, USA.

³ Niigata University, Faculty of Medicine, School of Health Sciences, Niigata 951-8518, Japan.
⁴ CNRS UMR 9002-CNRS-UM - Institute of Human Genetics, 34000, Montpellier cedex , France

5 INSERM, U1065, 06204 Nice cedex 3, France.

⁶ UFR de Médecine, Université de Nice Sophia Antipolis, 06000 Nice, France.

 7 Institute for Research in Biomedicine (iBiMED) and Ilidio Pinho Foundation,

Department of Medical Sciences, University of Aveiro, 3810-193 Aveiro, Portugal.

⁸ Shanghai Institute of Immunology, Department of Microbiology and Immunology, Shanghai Jiao Tong University School of Medicine, Shanghai 200025, PR China.

*Correspondence: E-mail: arguello@ciml.univ-mrs.fr ; pierre@ciml.univ-mrs.fr

Key Points

- SNUPR allows simultaneous profiling of PERK, IRE-1 and ATF6 activation with singlecell resolution.
- Inhibition of protein synthesis via PERK control the activation levels of the IRE-1/XBP1s and ATF6 pathway.
- IRE-1 activation and associated transcriptional signatures predict the outcome of patients with multiple myeloma treated with Bortezomib.
- IRE-1 activity, but not PERK or ATF6, is essential to acquire bortezomib resistance in multiple myeloma cell lines.

ABSTRACT

The unfolded protein response (UPR) is a key stress resistance pathway that has become a key potential target for improving the efficacy of cancer chemotherapy. The UPR involves the activation of three ER-resident stress sensors: PERK, IRE-1 and ATF6 with different signalling outcomes leading to cell death or survival. These cell-fate decisions are difficult to predict and are the result of the complex interaction of PERK, IRE-1 and ATF6 downstream events that have differences in their dynamics and their interplay. These characteristics of the UPR are still poorly defined due to lack of methods to monitor their activation simultaneously at single-cell level. We developed SNUPR (Single Nuclei analysis of the Unfolded Protein Response), an accessible technique

that allows the profiling of the three UPR branches in nuclear suspensions by flow cytometry, and applied it to study UPR dynamics in a cancer-specific context. By performing transcriptomic analysis, we found that ER-stress sensor specific gene signatures correlate with patient survival in several blood malignancies, and by using SNUPR, we detected high heterogeneity during UPR activation *in vitro* in different human cancer cell lines, which could not be have been predicted by the level of expression of the sensors. Our SNUPR analyses further indicate that this heterogeneity is explained by variations in the intensity and duration of ER stress-induced protein synthesis inhibition via PERK, acting as upstream regulator of both the IRE-1/XBP1 and ATF6 dependent transcriptional

programs. We extend the relevance of these observations by demonstrating that IRE-1/XBP1s pathway plays a critical role in bortezomib resistance of multiple myeloma cells and patients. Overall, we present here SNUPR, that can be used to monitor UPR dynamics with single-cell resolution and identified clinical contexts in which targeting a specific UPR branch could be detrimental or help circumventing chemotherapy resistance.

INTRODUCTION

The tumour microenvironment contains biochemical stressors that can disrupt protein folding within the endoplasmic reticulum (ER) and affect cell viability. Accumulation of misfolded proteins in the ER triggers a cellular response known as the unfolded protein response $(UPR)^1$. The UPR comprises distinct signalling branches, each activated by the dissociation in the ER lumen of the HSPA5 chaperone (BiP) from three ERresident sensors. These sensors include activating transcription factor 6 (ATF6), inositol-requiring enzyme 1-alpha (IRE1α, ERN1), and (PKR)-like endoplasmic reticulum kinase (PERK, EIF2AK3). Each sensor triggers a unique cellular response and leads to the activation of specific transcription factors, ultimately modulating a range of genes involved in ER homeostasis². (i) IRE1 α splices the mRNA encoding for the transcription factor X-box binding protein-1 (XBP1) involved in the expression of genes regulating ER size and function. (ii) ATF6 exits the ER to reach the Golgi apparatus and undergoes proteolytic release in the cytosol as ATF6f, which in turn act as a transcription factor that induces the synthesis of *XBP1* and ER chaperone genes like *HSPA5* (BiP) and others. (iii) PERK activation mediates the phosphorylation of eukaryotic initiation factor 2-alpha (eIF2α). While eIF2α phosphorylation leads to a decrease of global protein synthesis, it also favors the translation of

specific transcripts like activating transcription factor 4 (ATF4), C/EBP homologous protein (CHOP, DDIT3) or the phosphatase co-factor PPP1R15a (GADD34) mRNAs 3,4.

As a key regulator of proteostasis and cell death, the UPR has gained a lot of interest as a promising target in anti-tumoral therapy. Depending on the duration and degree of the ER stress, the UPR can provide either survival signals or trigger cell death through apoptosis. Tumour progression require high level of protein synthesis and exposes cells to multiple extrinsic and intrinsic stressors that can lead to chronic UPR activation and malignant progression^{1,3}. On the other hand, non-cancerous cells can also show activation of UPR pathways but in general rely less on constant high levels of translation. This difference offers an advantage for potential chemotherapies by modulating the UPR to specifically target cancer cells. Sustained pharmacological induction or repression of the UPR could exert beneficial anti-tumoral effects. Henceforth the interest to combine standard therapies with drugs directed towards unresolved ER stress or UPR modulation to restrain tumour growth; some of which have already shown to be effective in pre-clinical tumour models⁴⁻⁷.

Our understanding of the interplay between UPR effectors and how they influence the balance between cell survival and cell death in physiological contexts remains limited due to technical limitations. We developed "Single Nuclei Analysis of the Unfolded Protein Response" (SNUPR), a method that allows the simultaneous measure of ATF6f, IRE-1/XBP1s and PERK pathways activation, as well as their interplay on a single-cell and time-resolved basis.

Using SNUPR, we were able to highlight the heterogeneity of UPR activation in response to standard ER stressors on different cancer cell lines. This allowed us to shed light on how the intensity and duration of translation

inhibition via the PERK pathway can shape responses from the other UPR branches during ER-stress across various cancer cell lines. Additionally, our analysis allowed us to uncover the importance of the IRE1/XBP-1s axis in the resistance to bortezomib chemotherapy in multiple myeloma cell lines. Furthermore, transcriptomic analysis of multiple myeloma cohorts confirmed our hypothesis that the XBP1 gene signature alone can predict the outcome of multiple myeloma patients treated with bortezomib as monotherapy. By revealing the complex interplay and hierarchy between UPR branches via SNUPR, our findings underline how strategic manipulation of the UPR could present a promising therapeutic strategy for treating cancer or to stratify cancer patients to predict treatment efficacy.

RESULTS

Correlation between ER-stress sensors activation and survival prognosis in acute myeloid leukaemia and breast cancer patients.

Tumour growth often induces oxidative stress and glucose deprivation which in turn can cause oxidative damage and glycosylation defects that result in protein misfolding, ER stress and UPR activation¹⁰. The particular role of the different UPR branches in cancer is controversial, with both positive and negative outcomes described in the literature 7,9,11–13. To gain insights whether UPR branches are associated with prognosis in human cancer, we stratified Acute Myeloid Leukaemia (AML) and breast cancer patients by their expression levels of ATF6f, XBP1s and ATF4-targeted genes (Figure 1A). We then evaluated patient survival over time generating Kaplan-Meier curves on those subgroups of patients defined on mRNA expression levels (Figure 1B, 1D and Supplemental Figure $1)^{14}$. Only a high expression of certain ATF6-associated genes was correlated with increased patient survival for both types of cancer, with 5 out of 14 target mRNAs for AML (Figure 1B and Supplemental 1A) and 3 out of 5 target mRNAs for breast cancer (Figure 1D) presenting significative difference. We also found that several target genes of XBP1s correlated with longer median survival in AML patients, 7 of which showing statistical significance (Figure 1D and Supplemental Figure 1B). Overall, patients with cells overexpressing genes that are transcriptionally-dependent on XBP1s and ATF6f showed cross-correlation of expression (Figure 1C and 1E), but not ATF4, and had a markedly enhanced survival rate.

Besides unconventional splicing of *XBP1* mRNA, another hallmark of IRE-1 activation is the cleavage of different RNAs through a process termed RIDD (Regulated IRE1- Dependent Decay), leading to degradation of mRNAs coding for genes such as *ITGB2* and *IKZF1* (Supplemental Figure 2) ^{9–14}. In contrast to what we observed with XBP1 targets, we noted a variable and nonsignificant trend in survival rates when correlating survival with the expression level of RIDD targets (supplemental Figure 2) in AML. These results imply that the canonical IRE-1 activity, through *XBP1* splicing, is most likely contributing to patient survival in $AML^{15–}$ 20.

Contrastingly, most of the PERK/ATF4 target genes, such as *PPP1R15A* (GADD34) and *DDIT3* (CHOP), showed no correlation or anti-correlation with survival prognosis (Figure 1B, 1D and Supplemental Figure 1).

Nonetheless, certain non-exclusive ATF4 **Figure 1: UPR signatures correlate with survival prognosis of myeloid leukemia and breast cancer patients. (A)** Scheme of UPR three main branches. **(B-E)** Kaplan Meier survival curves and correlation matrices of genes under the control of ATF6, XBP1s or PERK corresponding to AML and breast cancer cohorts were generated using the Xena browser (USCC). Kaplan Meier curves were done based on dichotomized gene expression, specifically for values below quartile 1 (blue) and above quartile 3 (red) of both malignancies. Genes indicated are described to be under the control of ATF6 (orange), IRE-1/XBP1s (green) and PERK/ATF4 (blue). **(B)** Kaplan Meier curve and **(C)** correlation matrix for the AML cohort. **(D)** Kaplan Meier curve and **(E)** correlation matrix for the breast cancer cohort. Statistical analysis was performed using Log-rank test. **P* < 0.05, ***P* < 0.01, and ****P* < 0.001.

targets like *DDIT4, WARS*, *PIM*, and *PSAT1*21, were associated with lower survival rates in AML when overexpressed (Figure 1B and supplemental Figure 1C).

Altogether, the association of IRE-1/XBP1 and ATF6 signatures, but not ATF4 with survival suggests that in the presence of ER stress, UPR sensors may not be all activated simultaneously. Moreover, our result suggests that a cancer-specific association between IRE-1 and ATF6 activation and survival rates. Hence, a potential dichotomy and heterogeneity in ER stress sensors activation may influence disease progression and therapeutic response.

Single cell resolution profiling of UPR signalling branches via SNUPR

The heterogeneity and hierarchical activation of IRE-1, ATF6, and PERK in response to ER stress is not well understood. Despite multiple studies linking ER stress sensor activation with cell death, the specific effects of proteasome inhibitors, such as bortezomib 22 , on this process remain poorly understood. Additionally, the use of transcriptional approaches to investigate this phenomenon can be misleading due to the central role of post-transcriptional regulation in ER stress responses. We developed SNUPR (Single Nuclei UPR profiling), a flow cytometry-based method that allows to delineate the activation of all three UPR branches, ATF6, IRE-1, and PERK with single-cell resolution. SNUPR uses multi-parametric flow cytometry of single nuclear suspensions to measure XBP1s and ATF6f nuclear translocation as well as intracellular puromycin incorporation $2^{1,23,24}$ to simultaneously assess transcription factor translocation with overall inhibition of mRNA translation as an indirect measure of PERK activation (Figure 2).

First, we isolated nuclei from plasmacytoid dendritic cell line (CAL-1) and monocytic AML cell line (THP-1) cells and used microscopy to confirm the enrichment of nuclei postextraction, further validating their purity through immunoblot and flow cytometry assays targeting nuclear, plasma membrane and other organelles (supplemental Figure 3A-D). There was minimal presence of plasma membrane, mitochondrial, lysosomal, and endoplasmic reticulum contaminants in nuclear suspensions, indicating that our protocol allowed efficient nuclei isolation with minimal contamination from other intracellular compartments, permitting accurate quantification of transcription factors translocation.

Next, we employed fluorescent labelled antibodies to monitor the translocation of XBP1s and ATF6f transcription factors by flow cytometry (Figure 2A). We extracted nuclei from ER stress-induced THP-1 cells, treated with or without thapsigargin (Tg) or tunicamycin (Tm), in the presence or absence of specific inhibitors of IRE-1 $(4\mu8c)^{25}$, SP1/2 that mediate ATF6-cleavage (CeapinA7)²⁶ or PERK $(GSK2656157)^{27}$. By comparing the staining of the transcription factors between cells and nuclei, we obtained an enhanced signal to noise ratios for both XBP1s and ATF6f post-nuclear extraction (Figure 2B-C). The inhibition of UPR signalling pathways resulted in a decrease in nuclear staining of the corresponding transcription. These results demonstrate, on one hand the specificity of the measurements, and on the other, the higher signal to noise ratios obtained when analysing nuclear extractions; further corroborating the effectiveness of SNUPR in monitoring IRE-1 activation and ATF6 cleavage.

Our efforts to find suitable antibodies for detecting ATF4, as a direct readout of PERK activation by flow cytometry were however unsuccessful, and we turned towards protein synthesis inhibition measurement instead 28 (Figure 2D). Puromycin is a tRNA-aminoacyl analogue and measuring puromycin incorporation into peptides, we monitored global translation inhibition mediated by

PERK-dependent eIF2 α phosphorylation. We observed a very strong and significant correlation between nuclear and cellular levels of puromycinilated peptides 29 (supplemental Figure 3E). A marked decrease in puromycin signal was observed in nuclei from cells treated with the ER stressors Tg and Harringtonine (Figure 2D and Supplementary Figure S3E). Upon PERK inhibition (GSK2656157, PERKi), the puromycin signal remained unaltered after Tg treatment, supporting the validity and specificity of our approach as readout for PERK activation (Figure 2D). Consequently, SNUPR, by monitoring XBP1s and ATF6f translocation together with puromycin incorporation on isolated nuclei, allows the

simultaneous measure of all three UPR signalling branches activation with high accuracy.

Figure 2: SNUPR, a method to profile sensors activation during ER stress. (A) Scheme of SNUPR method. Following nuclei extraction, the activation of UPR branches is profiled by flow cytometry measurements of XBP1s and ATF6f translocation as well as puromycin levels as a readout for protein synthesis. **(B)** THP1 were treated with 400nM of thapsigargin for 4h in presence (or absence) of the ATF6 inhibitor CeapinA7 (6µM). Afterwards, nuclei were extracted and ATF6f levels were analysed on both permeabilized nuclei and cells. **(C)** THP1 were treated with 100ng/mL of tunicamycin for 6h in presence (or absence) of the IRE-1 inhibitor 4µ8c (10µM). Afterwards, nuclei were extracted and XBP1s levels were analysed on both permeabilized nuclei and cells. **(D)** Hela cells were treated with 400nM of thapsigargin for 30min in the presence (or absence) of the PERK inhibitor GSK2656157 (100µM) and treated with puromycin for 15min. Afterwards, nuclei were extracted and puromycin levels were analysed on both permeabilized nuclei and cells. Statistical analysis was performed using Mann–Whitney test (**P* < 0.05, ***P* < 0.01, ****P* < 0.001 and ****P ≤ 0.0001).

Deciphering cell type- and stressordependent UPR heterogeneity using SNUPR profiling

Given the clinical relevance of a potential association between UPR heterogeneity and patient response to treatment and survival, we treated seven human cell lines of diverse origin with thapsigargin (Tg) and tunicamycin (Tm) and applied SNUPR and qPCR analysis to monitor UPR activation over time (0-4h) (Figure 3 and supplemental Figure 4). SNUPR revealed divergent UPR activation patterns in response to the two stressors, but also great variations among the cell lines tested with the same stressor (Figure 3 and Supplemental Figure 4A). Solely based on the duration and intensity of the translation inhibition driven by the two compounds, we identified three distinct response patterns (Figure 3A). Group 1 (MOLT-4 and U937 cells) showed complete translation arrest within 30min to 4h of Tg treatment. Group 2 (HeLa, HEK293T, KASUMI and CAL-1) underwent up to 70% translation inhibition after 30min, recovering to initial levels within the subsequent 3h. Lastly, Group 3 (THP-1 monocytic AML line) presented little to no reduction of translation during Tg treatment, mirroring the previously reported behaviour of murine dendritic cells 30 .

Upon examining IRE-1 and ATF6 activation patterns, a significant increase in XBP1s translocation was noted within 4h of Tg treatment across most cell types, but a significant increase of ATF6f was only detected in two of the seven cell lines (MOLT-4 and THP-1, Figure 3A). Regarding translation, all cell lines except THP-1 cells displayed a significative reduction of protein synthesis after 30min, in some cases beginning to recover after 2h of Tg treatment (Figure 3A and 3B).

To determine if the different patterns of UPR were solely dependent on the cell line, we decided to use other ER-stress inducer. When Tunicamycin was used as the stressor, we observed a different pattern of response (supplemental Figure 4A). While most cells increased XBP1s expression after 4h, no significative changes were found on ATF6f, except for the U937 cell line. As for translation inhibition, all cell lines analysed displayed a moderate translation decrease within 4h of Tm treatment. Notably, THP-1 cells displayed increased translation within the first 30min of treatment, before returning to basal levels (supplemental Figure 4A). To validate SNUPR observations, we assessed the induction of mRNA levels of target genes of XBP1s, ATF6f and ATF4 in HeLa and THP-1 cells, since these cells displayed contrasting UPR induction patterns (Figure 3B and supplemental Figure 4B). The RT-qPCR results mirrored SNUPR results, with THP-1

cells experiencing a significant increase in ATF6f and XBP1s specific transcripts, such as *XBP1, HSPA5, RHEB,* or *CALR*, under Tginduced stress; while HeLa cells primarily induced ATF4-dependent transcription of *DDIT3* (*CHOP*) and *PPP1R15A* (*GADD34*) (Figure 3B and supplemental Figure 4B).

We next wondered whether the level of expression of each ER stress sensors could reflect the pattern of activation of the different cell lines. However, levels of IRE-1 or PERK measured by immunoblot (supplemental Figure 5A) did not show any significant correlation with the capacity of the cells to block translation or translocate XBP-1 upon ER-stress (supplemental Figure 5B). This highlights the challenge of predicting functional cellular responses based solely on steady-state phenotypic markers, and supports the advantage of using functional readouts such as the ones measured in SNUPR to follow UPR activation dynamically and dissect the interplay among the three different individual UPR branches.

Interestingly, we observed that the absence and presence of *PPP1R15A* and *DDIT3,* in THP-1 cells and HeLa cells respectively, coincided with the degree of measurable translation arrest in response to the stressors (Figure 3B), where THP-1 cells did not block protein synthesis, HeLa cells did. Additionally, cells whose protein synthesis remain most active during stress induce more nuclear translocation of XBP1s, while the opposite trend is observed with ATF6f (supplemental Figure 5C). Moreover, despite the rapid induction of *XBP1* mRNA splicing 2 hours post-Tg treatment in both HeLa and THP-1 cells (supplemental Figure 4B), significant increases in nuclear XBP1s levels were only observed in THP-1 cells that did not block protein synthesis. Altogether, these results suggest that the magnitude of IRE-1/XBP1s response is inversely proportional to the degree of translation inhibition experienced by stressed cells (supplemental Figure 5D). Specifically, we hypothesized that the translation of *XBP1* and *ATF6* mRNAs might be hindered by PERK/P-eIF2α-mediated translation inhibition, thereby delaying XBP1s synthesis and downstream transcription of its target genes. In contrast, ATF6f appeared to be relatively less dependent on active translation (Supplemental Figure 5C), as its

early mechanism of activation relies on the proteolytic cleavage of pre-existing ATF6 rather than its novo synthesis. In conclusion, SNUPR enabled us to uncover a heterogeneous dynamic of UPR activation among distinct cell types and in response to different stressors, hinting a potential dependence of UPR responses on intensity and duration of PERK-p-eIF2α-mediated translation inhibition.

Impact of translation arrest on activation of IRE1α/XBP1s and ATF6 Pathways

To further explore the effect of PERKmediated translation arrest on nuclear XBP1s and ATF6f, we took advantage of the absence or presence of transient translation inhibition in THP-1 and HeLa cells, respectively. To test our hypothesis, we forced translation inhibition in THP-1 (Figure 4A) and blocked translation inhibition in HeLa cells upon ER-stress and measured the level of activation of the IRE-1/XBP1 pathway. Although THP-1 and HeLa cells display contrasting UPR dynamics, both cell types express high levels of XBP1s after 4h of stimulation (Figure 3 and Figure 4). Cotreatment of THP-1 cells with Tg and the translation inhibitors rocaglamide (RocA) or

cycloheximide (CHX) efficiently suppressed translation and reduced nuclear translocation of XBP1s and ATF6f after 4h of UPR (Figure 4A). As expected, HeLa cells underwent translation arrest very rapidly within 30min of Tg exposure (Figure 4B), although full recovery was observed within 4h. Pretreatment of HeLa cells with the ISR inhibitor (ISRIB), a compound known to bypass the inhibitory effect of PERK-dependent eIF2α phosphorylation on translation³¹, circumvented this transient inhibition (Figure 4B) and led to significantly increased nuclear XBP1s levels at 4h post-treatment. ATF6f showed a similar trend of increased nuclear levels at 4h, but these were not statistically

Figure 4: Translation arrest delays the activation of the IRE1/XBP1s and ATF6 pathways. THP-1, HeLa cells and peripheral blood mononuclear cells (PBMC) from healthy donors were treated 30min or 4h with thapsigargin (Tg, 400nM) in the presence or absence of different translation inhibitors prior to SNUPR profiling by flow cytometry. **(A)** Translation levels and translocation of ATF6f and XBP1s measured on THP-1 cells after treatment with Tg in combination with Rocaglamide (RocA, 100nM) or cycloheximide (CHX, 5uM). **(B)** Translation levels and translocation of ATF6f and XBP1s measured on HeLa cells after treatment with Tg combined with ISRIB (1ug/mL). (**C**) PBMCs isolated from 6 healthy donors were treated with thapsigargin (Tg, 400nM) for 30min or 4h in the presence or absence of guanabenz (GBZ, 50µM) prior to nuclear isolation and SNUPR profiling by flow cytometry of translation levels and nuclear translocation of ATF6f and XBP1s. Statistical analysis was performed using 2way ANNOVA test. **P* < 0.05, ***P* < 0.01, and ****P* < 0.001.

significant. To further investigate, the downstream effects of altering translation levels we measured XBP1s-dependent genes expression such as *RHEB*, *HERPUD1*, or *SRPRA* on Tg- and ISRIB-treated HeLa cells and detected no significant differences in mRNA expression levels (supplemental Figure 6A). These results suggest that the transient (30 min) inhibition of translation and delay in XBP1s protein expression observed in HeLa cells, can be circumvented by ISRIB, but is not prolonged enough to strongly impact the transcription of XBP1s target genes.

SNUPR highlights a cell-type dependent UPR profiles in PBMCs

We extended our observations of UPR activation to primary immune cells. For this, we expanded the capabilities of SNUPR by incorporating intracellular staining of lineagespecific transcription factors such as PU.1 (Monocytes) and GATA3 or BCL-6 (T cells) as well as global levels of epigenetic marks (supplemental Figure 7A-B). This enabled the dissection of UPR activation in heterogeneous primary cell samples such as human PBMCs. To validate this approach, we first stained healthy donor PBMC (whole cells) using surface and nuclear markers simultaneously (supplemental Figure 7A-B). Among the different nuclear markers examined, we found that PU.1 and GATA3 were sufficient to unequivocally identify monocytes, B cells and a third cluster of T/NK cells (supplemental Figure 7C). Using this strategy, we analysed isolated nuclei from PBMC samples treated with Tg in the presence or absence of guanabenz (GBZ), a molecule that inhibits eIF2α dephosphorylation and thus inhibits the recovery of translation 32 (supplemental Figure 7D). Our findings indicate that UPR sensors activate differentially in distinct cellular subsets in response to Tg. In addition, ATF6f was primarily observed in nuclei from

monocytes and B cells, while XBP1s was predominantly found in monocyte and to a lower extent in B and T/NK cell nuclei (supplemental Figure 7D). Furthermore, and concordant with our previous results on cell lines, primary monocytes displayed increased XBP1s levels after 4h of Tg activation, which was significantly reduced after translation inhibition with GBZ (supplemental Figure 7D).

Taken together, these findings validate that translation arrest due to PERK activity can modulate IRE-1/XBP1s axis responses. We further show that SNUPR, in combination with specific nuclear lineage markers, offers an effective method to profile the activation of the three UPR branches in mixed primary cell samples.

Role of IRE-1/XBP1s signalling in Bortezomib resistance in multiple myeloma cells

We sought to further explore how heterogeneity in UPR activation might impact the chemotherapy response in patients with hematologic cancer. Specifically, we focused on the role of endoplasmic reticulum (ER) stress response in mediating the efficacy of Bortezomib (BTZ) (Velcade, previously PS-341). BTZ is a proteasome inhibitor that is currently included into the first line of treatment against multiple myeloma (MM) and has been reported to induce cytotoxic ER stress 33 .

We used SNUPR to profile the UPR response to BTZ treatment across several leukemia and MM cell lines over time (0-6h). BTZ treatment resulted in decreased protein synthesis in most cell lines, with the notable exception of U937 cells (supplemental Figure 8A). This contrasted with the results observed upon Tg treatment (Figure 3). Although variable in intensity, XBP1s translocation was consistent throughout cell lines; ATF6 translocation, however, was only detected on the leukemia cell lines but not in RPMI and

LPI MM cell lines (supplemental Figure 8A). Additionally, we used SNUPR to analyze nuclear accumulation of CHOP (DDIT3), a pro-apoptotic transcription factor commonly associated with the UPR and PERK-ATF4 pathway. CHOP induction by BTZ was induced in most cell lines, except for THP1, where only a moderate induction trend without statistical significance was noted. Taken together, these observations corroborate a BTZ-mediated activation of the UPR.

To assess whether activation of any of the specific UPR branches played an essential role in BTZ toxicity, we quantified BTZinduced cytotoxicity after 24h of treatment in presence of specific pharmacological inhibitors for each of the three ER stress sensors. Inhibition of PERK, IRE-1 and ATF6 pathways did not rescue BTZ-induced cell death (Figure 5A, Supplemental Figure 8B). Moreover, in LP1 MM cells, a BTZ resistant subpopulation persisted even at higher doses of BTZ (Figure 5A, supplemental 8B and 8C, bottom). Interestingly, IRE-1 inhibition in this resistant cell subset significantly increased cell death, revealing that its survival depends on IRE-1 (Figure 5A; and supplemental 8B and 8C). Inhibition of IRE-1 with the RNAse inhibitor 4µ8c alone did not show any toxicity in absence of BTZ, while higher doses of the IRE-1 kinase inhibitor Kira6 decreased the overall survival of MM cells in all conditions (Figure 5B). Given the differences of specificity of the 2 compounds and knowing that Kira6 also inhibits the p38 and ERK MAP kinase^{34,35}, we suspect an IRE1-independent effect in Kira6 cytotoxicity at these higher concentrations. Overall, these results suggest that activating the UPR is not essential for BTZ to mediate cytotoxicity, but in contrast, in

Multile Myeloma cells, IRE-1 activity contributes to resistance to Bortezomib.

To further characterize the UPR mechanism of resistance to BTZ, we performed SNUPR and transcript analysis on LP1 and RPMI cell

lines treated with BTZ in the presence or absence of 4µ8C (IRE-1i) (Figure 5C and 5D and supplemental Figure 9). Our results confirmed that IRE-1 inhibition decreases basal level of nuclear XBP1s, together with *XBP1* mRNA splicing and expression of XBP1s-regulated genes such as *HERPUD1* or *DNAJB9* (Supplemental Figure 9A). In contrast, ATF6f translocation was increased after IRE1 inhibition, but transcription of *ATF6a* mRNA and of its target *HSPA5* remained stable across all conditions (Figure 5C and 5D and Supplemental Figure 9A), suggesting that the modest effect of IRE1i on ATF6f translocation has only limited effect on downstream ATF6-dependent transcription and confirming that IRE-1/XBP1s is the only branch of the UPR that contributes to increase resistance to BTZ of MM cells.

Pharmacological UPR modulation modestly contributes to overturn resistance to BTZ in multiple myeloma cell lines

Upon our findings of the significant impact of translation inhibition on the IRE-1/XBP1s axis and the involvement of this pathway in resisting to BTZ treatment, we harnessed these results by investigating whether UPR inducing drugs could synergize with BTZ. A reinforced UPR could further drive PERK activation and eIF2α phosphorylation levels to reduce XBP1s translation and thus undermine BTZ resistance by dwarfing the consequences of IRE-1 signaling (Figure 4).

Additionally, we tested HA15, a specific inhibitor of the ATP dependent chaperone BiP/HSPA5, which was reported to exert its activity by inducing a lethal ER stress, particularly in melanoma cells³⁶³⁷. We performed SNUPR on LP1 and RPMI cell lines treated with HA-15 over 8h (Figure 6B). HA15 triggered XBP1s translocation in both cell lines, as well as, some expected CHOP

synthesis and translocation³⁷. Despite CHOP activation, HA15 had no impact on translation levels in LP1 and even slightly elevated them after 8h in RPMI cells. We nevertheless tested the toxicity of HA-15 in MM cells, in presence of the different UPR inhibitors (Figure 6B). We found that HA15 efficiently killed both cell lines at concentrations above 5µ, but surprisingly inhibition of the IRE-1 pathway, and not of the other UPR branches, had a protective effect and reduced the efficacity of the HSPA5 inhibiting compound. Thus, contrasting with BTZ, HA15 seems to rely on IRE-1 activation to kill MM cells and inhibition of this specific UPR branch leads to enhance survival. These contrasting results called for further assessment of the combinatorial effect of exposing MM cells to HA15 together with BTZ. Co-treatment with both compounds had a modest enhancing effect on the activation of the UPR monitored with SNUPR (Figure 6A). Levels of translation were slightly reduced and accompanied with an elevation of CHOP nuclear levels and equivalent translocation of ATF6f and XBP1s (Figure 6C). When examining cytotoxicity, no synergy in the killing of MM cells could be observed by gradually increasing drugs quantities (Figure 6D), while HA15 killed efficiently BTZ resistant MM cells at higher concentrations. Interestingly, although the two drugs induced IRE-1 activation, it had opposite consequences for the cells: IRE-1 activity mediating increased resistance to BTZ, while promoting cell death in response to HA15.

Taken together, these findings suggest that modulation of the UPR response via GBZ and IRE-1 inhibitors or ER stress inducers such as HA-15 could be complementary clinical approaches in the context of BTZ resistance (Figure 5 and Figure 6).

Figure 6. Pharmacological UPR modulation contributes to overturn resistance to BTZ in MM cell lines. **(A)** Flow cytometry analysis of survival of LP1 and RPMI cells treated or not with GBZ (50µM) in combination with increasing concentrations of BTZ for 24h. **(B)** SNUPR with GBZ (50µM) in combination with increasing concentrations of BTZ for Z4n. **(B)** SNUPR
profiling of LP1 and RPMI cells treated for 4h with BTZ in presence or absence of GBZ. **(C)** Flow cytometry analysis of survival of LP1 and RPMI cells treated with different concentrations of BTZ (1nM, 10nM and 100nM) in combination with increasing concentrations of HA15 for 24h. **(D)** SNUPR profiling of LP1 and RPMI cells treated 4h with BTZ in presence or absence of HA15.

UPR Gene Signatures and Their Clinical Relevance in Multiple Myeloma

We have shown that the IRE-1/XBP1 pathway is associated with resistance to BTZ treatment in human MM cell lines in-vitro. To test the clinical relevance of these findings, we investigated whether the presence of XBP1 transcriptional signatures correlated with resistance to BTZ and/or survival in treated MM patient. For this analysis, we focused on the Mulligan cohort of relapsed MM patients who were treated exclusively with BTZ³⁸. Patients were stratified based on the expression levels of gene signature consisting in a set of XBP1 target genes prior to treatment, and survival probability was monitored over time (Figure 7). Notably, high mRNA expression levels of most genes of the IRE-1α/XBP1s pathway significantly correlated with a poor prognosis (Figure 7A). To determine whether the XBP1 gene

signature is specifically predictive of poor prognosis following BTZ treatment, or whether it serves as a marker of adverse outcomes independently of the treatment, we conducted an analysis using three different MM patient cohorts of patients treated with Dexamethasone, with anti-CD38 as monotherapy, or receiving a combination of immunomodulatory drugs (IMiDs), dexamethasone (Dex), and high-dose melphalan followed by autologous stem cell transplantation (Figure 7B, 7C and 7D; respectively). Strickinlgy, the XBP1 gene signature had strong predictive value in patients treated with Bortezomib, but not in patients treated with other treatments. This association reinforces the potential relevance of the IRE-1/XBP1s pathway in BTZ resistance and the potential therapeutic value of its modulation (Figure 7E).

Figure 7. XBP1 gene signature correlates with unfavorable outcomes in Multiple Myeloma patients treated with Bortezomib. Transcriptional levels of XBP1 target genes was used to stratify and perform survival curves of cohorts of MM patients treated with Bortezomib (A), Dexamethasone (B), anti-CD38 monoclonal antibody (C) and PI/IMiDs/Dex HDT and ASCT therapy (D). Summary of results and model (E)

DISCUSSION

Under physiological and pathological conditions, cells can activate the unfolded protein response (UPR) to cope with the accumulation of unfolded or misfolded proteins in the ER. The primary purpose of the UPR is to alleviate cellular stress by employing various biochemical mechanisms that enhance ER protein folding capacity, degrade misfolded proteins and suppress general protein synthesis to aid cell survival; or activate cell death programs if there is sustained and chronic stress². Besides rapid proliferation and high mutation rate, tumour cells are often confronted with hostile environmental conditions, such as hypoxia, nutrient depletion, and presence of free radicals, which makes them highly reliant on the UPR to thrive^{5,39} and resist to chemotherapy. This makes of the UPR an interesting target pathway for therapeutic approaches aimed at eliminating cancer cells.

The lack of methodologies to measure simultaneously activation of individual UPR branches has hindered our capacity to understand the details of UPR dynamics and existing crosstalks with respect to cell type, nature of the stress and length of the stimulation. To address this, we developed SNUPR (Single Nuclei Analysis of the UPR), a novel method to study UPR pathways activation in parallel and with single-cell resolution. The uniqueness of SNUPR lies in combining the flow cytometry quantification of key transcription factors downstream of UPR activation², like XBP1s, ATF6f and CHOP after nuclear translocation, along with active translation through measurement of puromycin incorporation into cells 23,29 . Decreased puromycinylation represent a direct readout of PERK-dependent inhibition of protein synthesis. By purifying nuclei rather than permeabilized cells, we increased resolution and contrast to simultaneously monitor all these elements in different types of samples. Furthermore, by incorporating lineage-associated transcription factors, we increased SNUPR capacity to explore UPR activation in different cell subsets within heterogeneous cell populations such as PBMC. Importantly, the resolutive power of SNUPR can be further enhanced or adapted for different biological models by utilizing or developing suitable monoclonal antibodies raised against cell-specific transcription factors or other UPR-dependent transcription factors such as ATF4.

SNUPR uncovered the heterogeneity of UPR responses on different cell types exposed to ER stressors, revealing differences between closely related cell types. Thapsigargin and tunicamycin are two classically used chemical ER stressors, both leading to misfolded protein accumulation in the ER lumen but through different mechanisms of action. Irrespective of the cell type analysed, SNUPR confirmed that Tg and elicit distinct ER stress responses and kinetic of action on different cell types, something of significance since these chemicals are generally used indistinctly for UPR studies.

Our observations also highlighted a hierarchy between the IRE-1/XBP1s and PERK pathways activation. This seem to be due to the translational control of XBP1s production by protein synthesis inhibition mediated by PERK. In this way, PERK controls the dynamics of UPR at the translational level independently of efficient IRE1-dependent mRNA splicing. Inhibitory eIF2α phosphorylation by PERK is counteracted by the UPR-inducible GADD34/PP1c phosphatase complex, which sets the pace for rescuing protein synthesis 21 . The balance

between PERK and GADD34 can indirectly determine the levels of XBP-1 and ATF6 activation displayed by stressed cells. Notably, GADD34 has been shown to play a critical role in translation recovery within 4h after UPR activation $40,41$, coinciding with the emergence of XBP1s expression. Given the availability of numerous pharmacological inhibitors targeting the integrated stress response (ISR) pathway⁴², interference with PERK, eIF2α or GADD34 could be used to regulate not only the ISR, but also to modulate XBP1s signalling for therapeutic purposes.

Bortezomib (BTZ) has proven effective in inducing apoptosis in multiple myeloma cells, significantly improving patient outcomes through modulation of several pathways, including endoplasmic reticulum stress signalling^{43–45}. However, the persistent issues of frequent relapses and treatment resistance continue to limit its therapeutic success. It has been proposed that resistance may arise due to mutations in the highly conserved binding pocket within the proteasome subunit β5 (PSMB5)46. However, this explanation appears insufficient since mutations in the PSMB5 gene do not consistently account for BTZ resistance in primary MM sequencing studies $47,48$.

Current standard of care treatment of MM includes BTZ, but also Thalomide, Dexamethasone, high dose radiation therapy and autologous stem cell transplantation. One of the goals of personalized medicine is to avoid treatment of patients that will not benefit of a therapy, thus avoiding secondary effects. In our study, by combining stratification using the XBP-1 signature in patients treated with BTZ as monotherapy, we identified patients showing high survival rates, similar to the survival curves observed in patients treated with the standard of care combo therapy (Figure 7A vs 7D). Further studies and clinical trials will need to be performed to probe the use of SNUPR and XBP1s-dependent gene signature can

identify patients that can benefit of BTZ as monotherapy, or in combination with lower doses of the combo therapy. Moreover, we observed that the combination of BTZ with IRE-1 inhibitor (4µ8C) eliminated proteasome inhibition resistant cells, thus suggesting that this XBP1 signature could be used to identify patients that would strongly benefit of treatment with IRE-1 inhibitors.

The UPR pathway has emerged as a key factor in BTZ resistance in MM. However, its exact role and the implication of its different branches in BTZ cytotoxicity and resistance have remained elusive⁴⁹. Existing evidence presents contradictory contributions of the IRE-1 and PERK branches to BTZ resistance, underlining the complex and heterogenous role of the UPR in modulating cell survival and death in $MM^{50,51}$. We hypothesized that this unresolved complexity could be attributed to the variability of the interplay existing among the different UPR signalling pathways, so we dissected the impact of BTZ on UPR dynamics in different cancer cell lines. BTZ treatment activated all three UPR branches in most leukaemia cells, except for MM cell lines. Interestingly, MM cells failed to induce an ATF6f response, even though early ATF6 activation is relatively unaffected by PERKdependent translation arrest. Although BTZ induced a robust UPR response and even CHOP translocation in MM cells, we observed resistance to cell death with escalating doses of the drug. Retrospective analysis of transcription profiles from BTZ-treated patients indicated that the presence of an IRE-1/XBP1s transcriptional signature, rather than a PERK/ATF4 signature, is strongly associated with poor clinical outcomes. The synergy observed between IRE1 inhibition and BTZ treatment in killing resistant MM cells further corroborated the relevance of this stratification analysis. Overactivation of the IRE-1 pathway appears therefore contribute to BTZ resistance, contrary to previous reports suggesting that loss of XBP1s function or induction of the PERK

pathway are major contributors to BTZ resistance $37-39$. The synergy observed between IRE1 inhibition and BTZ treatment in killing resistant MM cells further corroborated the relevance of this stratification analysis. Overactivation of the IRE-1 pathway appears therefore to contribute to BTZ resistance, contrary to previous reports suggesting that loss of XBP1s function or induction of the PERK pathway are major contributors to BTZ $resistance^{50–52}$

We compared the SNUPR profiling of BTZ with that of HA15, a specific inhibitor of BiP/HSPA5 shown to activate the UPR and kill effectively melanoma cells $36,37$. We observed that HA15 did not induce the UPR as strongly as BTZ, however, it still induced death in MM cell lines. Killing seemed to involve IRE-1 activity, rather than the PERK/ATF4/CHOP pathway and subsequent autophagy and apoptosis triggering, as suggested in initial reports cells $36,37$. The cytotoxic consequences of HA15 exposure may therefore vary considerably according to tumor cells specificity and the level of UPR heterogeneity displayed.

The IRE-1/XBP1s pathway appears as an important player on MM cell response to chemotherapeutic drug treatments and modulating its activity could offer new therapeutic strategies. The type of strategy chosen, however, will depend on the effect of the combined drug used over UPR pathways interplay, since we observed that the intensity of UPR activation, including the levels of translation inhibition, plays a significant role in the cytotoxic effects of ER stressors. BTZ and HA-15 for example, induce different UPR activation dynamics, and their cytotoxicity depends on opposite sides of the IRE-1 axis. These cell specific differences in the interplay between individual UPR signalling branches, and their potential contribution to chemotherapy, could only be evidenced with the resolutive capacity of SNUPR. This enhanced dissection of the UPR and its relationship to anti-tumoral drug treatment or resistance acquisition should prove useful in devising more effective MM treatments and predicting patient response.

In conclusion, our study presents a fresh perspective on the significance of the UPR in haematological cancers, particularly in the context of chemotherapy resistance. Our observations underscore the challenge of predicting cellular functional responses based solely on steady-state phenotypic markers and individual measurement of UPR pathway activation. The development of SNUPR offers an alternative for predicting potential BTZ resistance acquisition and evaluate the impact of novel anti-tumoral compounds targeting the UPR in cancer patient samples for a more personalized therapeutic approach.

REFERENCES

- 1. Chen X, Cubillos-Ruiz JR. Endoplasmic reticulum stress signals in the tumour and its microenvironment. *Nature reviews. Cancer*. 2021;21(2):71.
- 2. Hetz C, Papa FR. The Unfolded Protein Response and Cell Fate Control. *Mol Cell*. 2018;69(2):169–181.
- 3. Han C, Jin L, Mei Y, Wu M. Endoplasmic reticulum stress inhibits cell cycle progression via induction of p27 in melanoma cells. *Cell Signal*. 2013;25(1):144–149.
- 4. Costa-Mattioli M, Walter P. The integrated stress response: From mechanism to disease. *Science*. 2020;368(6489):eaat5314.
- 5. Cherubini A, Zito E. ER stress as a trigger of UPR and ER-phagy in cancer growth and spread. *Front Oncol*. 2022;12:997235.
- 6. Mbofung RM, McKenzie JA, Malu S, et al. HSP90 inhibition enhances cancer immunotherapy by upregulating interferon response genes. *Nat Commun*. 2017;8(1):451.
- 7. Lin J, Liu H, Fukumoto T, et al. Targeting the IRE1α/XBP1s pathway suppresses CARM1-expressing ovarian cancer. *Nat Commun*. 2021;12(1):5321.

- 8. Hurst KE, Lawrence KA, Essman MT, et al. Endoplasmic Reticulum Stress Contributes to Mitochondrial Exhaustion of CD8+ T Cells. *Cancer Immunol Res*. 2019;7(3):476–486.
- 9. Shi Z, Yu X, Yuan M, et al. Activation of the PERK-ATF4 pathway promotes chemo-resistance in colon cancer cells. *Sci Rep*. 2019;9(1):3210.
- 10. Alam R, Kabir MF, Kim H-R, Chae H-J. Canonical and Noncanonical ER Stress-Mediated Autophagy Is a Bite the Bullet in View of Cancer Therapy. *Cells*. 2022;11(23):3773.
- 11. Martinez-Turtos A, Paul R, Grima-Reyes M, et al. IRE1α overexpression in malignant cells limits tumor progression by inducing an anti-cancer immune response. *Oncoimmunology*. 2022;11(1):2116844.
- 12. Boyle ST, Poltavets V, Kular J, et al. ROCK-mediated selective activation of PERK signalling causes fibroblast reprogramming and tumour progression through a CRELD2-dependent mechanism. *Nat Cell Biol*. 2020;22(7):882–895.
- 13. Salvagno C, Mandula JK, Rodriguez PC, Cubillos-Ruiz JR. Decoding Endoplasmic Reticulum Stress Signals in Cancer Cells and Anti-tumor Immunity. *Trends Cancer*. 2022;8(11):930–943.
- 14. Örd T, Örd D, Kaikkonen MU, Örd T. Pharmacological or TRIB3-Mediated Suppression of ATF4 Transcriptional Activity Promotes Hepatoma Cell Resistance to Proteasome Inhibitor Bortezomib. *Cancers*. 2021;13(10):2341.
- 15. Eletto D, Eletto D, Boyle S, Argon Y. PDIA6 regulates insulin secretion by selectively inhibiting the RIDD activity of IRE1. *FASEB J*. 2016;30(2):653–665.
- 16. Gómora-García JC, Gerónimo-Olvera C, Pérez-Martínez X, Massieu L. IRE1α RIDD activity induced under ER stress drives neuronal death by the degradation of 14-3-3 θ mRNA in cortical neurons during glucose deprivation. *Cell Death Discov*. 2021;7(1):131.
- 17. Hollien J, Lin JH, Li H, et al. Regulated Ire1-dependent decay of messenger RNAs in mammalian cells. *J Cell Biol*. 2009;186(3):323–331.
- 18. Moore K, Hollien J. Ire1-mediated decay in mammalian cells relies on mRNA

sequence, structure, and translational status. *Mol Biol Cell*. 2015;26(16):2873– 2884.

- 19. Quwaider D, Corchete LA, Martín-Izquierdo M, et al. RNA sequencing identifies novel regulated IRE1 dependent decay targets that affect multiple myeloma survival and proliferation. *Exp Hematol Oncol*. 2022;11(1):18.
- 20. Maurel M, Chevet E, Tavernier J, Gerlo S. Getting RIDD of RNA: IRE1 in cell fate regulation. *Trends Biochem Sci*. 2014;39(5):245–254.
- 21. Dalet A, Argüello RJ, Combes A, et al. Protein synthesis inhibition and GADD34 control IFN-β heterogeneous expression in response to dsRNA. *EMBO J*. 2017;36(6):761–782.
- 22. McConkey D, Nawrocki ST, Andtbacka R. Velcade displays promising activity in primary effusion lymphoma cells. *Cancer Biol Ther*. 2005;4(4):491–492.
- 23. Schmidt EK, Clavarino G, Ceppi M, Pierre P. SUnSET, a nonradioactive method to monitor protein synthesis. *Nat Methods*. 2009;6(4):275–277.
- 24. Argüello RJ, Reverendo M, Mendes A, et al. SunRiSE - measuring translation elongation at single-cell resolution by means of flow cytometry. *J Cell Sci*. 2018;131(10):jcs214346.
- 25. Cross BCS, Bond PJ, Sadowski PG, et al. The molecular basis for selective inhibition of unconventional mRNA splicing by an IRE1-binding small molecule. *Proc Natl Acad Sci U S A*. 2012;109(15):E869-878.
- 26. Gallagher CM, Garri C, Cain EL, et al. Ceapins are a new class of unfolded protein response inhibitors, selectively targeting the ATF6α branch. *eLife*. 2016;5:e11878.
- 27. Axten JM, Romeril SP, Shu A, et al. Discovery of GSK2656157: An Optimized PERK Inhibitor Selected for Preclinical Development. *ACS Med. Chem. Lett.* 2013;4(10):964–968.
- 28. Han J, Back SH, Hur J, et al. ER-stressinduced transcriptional regulation increases protein synthesis leading to cell death. *Nat Cell Biol*. 2013;15(5):481–490.
- 29. David A, Dolan BP, Hickman HD, et al. Nuclear translation visualized by

ribosome-bound nascent chain puromycylation. *J Cell Biol*. 2012;197(1):45–57.

- 30. Mendes A, Gigan JP, Rodriguez Rodrigues C, et al. Proteostasis in dendritic cells is controlled by the PERK signaling axis independently of ATF4. *Life Sci Alliance*. 2021;4(2):e202000865.
- 31. Sidrauski C, McGeachy AM, Ingolia NT, Walter P. The small molecule ISRIB reverses the effects of eIF2α phosphorylation on translation and stress granule assembly. *eLife*. 2015;4:e05033.
- 32. Tsaytler P, Harding HP, Ron D, Bertolotti A. Selective inhibition of a regulatory subunit of protein phosphatase 1 restores proteostasis. *Science*. 2011;332(6025):91–94.
- 33. Carlsten M, Namazi A, Reger R, et al. Bortezomib sensitizes multiple myeloma to NK cells via ER-stress-induced suppression of HLA-E and upregulation of DR5. *Oncoimmunology*. 2019;8(2):e1534664.
- 34. Tang X, Teder T, Samuelsson B, Haeggström JZ. The IRE1α Inhibitor KIRA6 Blocks Leukotriene Biosynthesis in Human Phagocytes. *Front Pharmacol*. 2022;13:806240.
- 35. Ghosh R, Wang L, Wang ES, et al. Allosteric inhibition of the IRE1α RNase preserves cell viability and function during endoplasmic reticulum stress. *Cell*. 2014;158(3):534–548.
- 36. Cerezo M, Lehraiki A, Millet A, et al. Compounds Triggering ER Stress Exert Anti-Melanoma Effects and Overcome BRAF Inhibitor Resistance. *Cancer Cell*. 2016;29(6):805–819.
- 37. Cerezo M, Rocchi S. New anti-cancer molecules targeting HSPA5/BIP to induce endoplasmic reticulum stress, autophagy and apoptosis. *Autophagy*. 2017;13(1):216–217.
- 38. Mulligan G, Mitsiades C, Bryant B, et al. Gene expression profiling and correlation with outcome in clinical trials of the proteasome inhibitor bortezomib. *Blood*. 2007;109(8):3177–3188.
- 39. Liang R, Tan H, Jin H, et al. The tumourpromoting role of protein homeostasis: Implications for cancer immunotherapy. *Cancer Letters*. 2023;573:216354.
- 40. Novoa I, Zeng H, Harding HP, Ron D. Feedback inhibition of the unfolded protein response by GADD34-mediated dephosphorylation of eIF2alpha. *J Cell Biol*. 2001;153(5):1011–1022.
- 41. Novoa I, Zhang Y, Zeng H, et al. Stressinduced gene expression requires programmed recovery from translational repression. *EMBO J*. 2003;22(5):1180– 1187.
- 42. Tian X, Zhang S, Zhou L, et al. Targeting the Integrated Stress Response in Cancer Therapy. *Front Pharmacol*. 2021;12:747837.
- 43. Manasanch EE, Orlowski RZ. Proteasome inhibitors in cancer therapy. *Nat Rev Clin Oncol*. 2017;14(7):417– 433.
- 44. Nawrocki ST, Carew JS, Dunner K Jr, et al. Bortezomib Inhibits PKR-Like Endoplasmic Reticulum (ER) Kinase and Induces Apoptosis via ER Stress in Human Pancreatic Cancer Cells. *Cancer Research*. 2005;65(24):11510–11519.
- 45. Fels DR, Ye J, Segan AT, et al. Preferential cytotoxicity of bortezomib toward hypoxic tumor cells via overactivation of endoplasmic reticulum stress pathways. *Cancer Res*. 2008;68(22):9323–9330.
- 46. Oerlemans R, Franke NE, Assaraf YG, et al. Molecular basis of bortezomib resistance: proteasome subunit beta5 (PSMB5) gene mutation and overexpression of PSMB5 protein. *Blood*. 2008;112(6):2489–2499.
- 47. Politou M, Karadimitris A, Terpos E, et al. No evidence of mutations of the PSMB5 (beta-5 subunit of proteasome) in a case of myeloma with clinical resistance to Bortezomib. *Leuk Res*. 2006;30(2):240–241.
- 48. Lichter DI, Danaee H, Pickard MD, et al. Sequence analysis of β-subunit genes of the 20S proteasome in patients with relapsed multiple myeloma treated with bortezomib or dexamethasone. *Blood*. 2012;120(23):4513–4516.
- 49. Obeng EA, Carlson LM, Gutman DM, et al. Proteasome inhibitors induce a terminal unfolded protein response in multiple myeloma cells. *Blood*. 2006;107(12):4907–4916.
- 50. Yamashita Y, Morita S, Hosoi H, et al. Targeting Adaptive IRE1α Signaling and

PLK2 in Multiple Myeloma: Possible Anti-Tumor Mechanisms of KIRA8 and Nilotinib. *Int J Mol Sci*. 2020;21(17):6314.

- 51. Bagratuni T, Patseas D, Mavrianou-Koutsoukou N, et al. Characterization of a PERK Kinase Inhibitor with Anti-Myeloma Activity. *Cancers (Basel)*. 2020;12(10):2864.
- 52. Leung-Hagesteijn C, Erdmann N, Cheung G, et al. Xbp1s-negative tumor B cells and pre-plasmablasts mediate therapeutic proteasome inhibitor resistance in multiple myeloma. *Cancer Cell*. 2013;24(3):289–304.

Supplemental Figure 1: Branch-specific UPR signatures correlate with survival prognosis of patients with Acute Myeloid Leukemia. (A-C) Kaplan Meier survival curves for genes under the control of ATF6, XBP1s or PERK generated for AML. Kaplan Meier curves were done based on dichotomized gene expression, specifically for values below quartile 1 (blue) and above quartile 3 (red). Genes indicated are described to be under the control of ATF6 (A); IRE-1/XBP1s (B) and PERK/ATF4 (C). Statistical analysis was performed using Logrank test. **P* < 0.05.

Supplemental Figure 2: RIDD targets expression correlate with survival prognosis of AML patients. Kaplan Meier survival curves for mRNAs targeted by RIDD were generated for AML. Kaplan Meier curves were done based on dichotomized gene expression, specifically for values above quartile 1 (blue) and quartile 3 (red). Statistical analysis was performed using Log-rank test. **P* < 0.05.

Supplemental Figure 3: Quality control of nuclear extraction for SNUPR profiling. (A) Nuclei or whole CAL-1 cells were permeabilized or not and stained with nucleopore antibody. (**B**) Staining of nuclear pores and calnexin was analysed by microscopy in CAL-1 and THP-1 whole cells and nuclei. (**C**) CAL-1 cells (c) or nuclei (n) suspensions were lysed and analysed by immunoblot. Relative quantification of each protein is indicated on the right side of the panel. (**D**) Whole cells and nuclei extract from mouse blood stained with indicated surface markers. (**E**) Correlation of puromycin MFI (normalized to control) of cells versus isolated nuclei in response to different pharmacological compounds. Spearman test: R= 0,8559 p-value <0,0001. CNT: Control.

Supplemental Figure 4. Rapid and efficient inhibition of protein synthesis modulates UPR activation. (A) Distinct cancer cell lines were treated with 100ng/ml of tunicamycin (Tm) for 30min, 2h and 4h prior to nuclei extraction and further SNUPR profiling of UPR activation by measuring translation (puromycin incorporation) and translocation of ATF6f and XBP1s by flow cytometry. Statistical analysis was performed using Kruskall-Wallis test for each cell line. **P* < 0.05, ***P* < 0.01, ****P* < 0.001 and *****P* < 0.0001. **(B)** qPCR quantification of relative

mRNA levels of UPR-associated transcripts on HeLa and THP-1 cells treated for 30min, 2h and 4h with thapsigargin (Tg, 400nM).

Supplemental Figure 5: Correlation of translation inhibition with reduced XBP1s expression. (A) Quantification of IRE-1a and PERK protein levels on different cell lines was assessed by immunoblot. **(B)** Correlation analyses between expression levels of IRE-1 and PERK with translation levels or nuclear translocation of XBP1s for each cell line was assessed. Further correlation analyses between early translation levels (30min) and nuclear expression of **(C)** ATF6 and **(D)** XBP1s after 2h of ER stress induction was evaluated using the Spearman test. Spearman R-score and p-values are depicted in the lower panel.

Supplemental Figure 6. Translation inhibition delays IRE-1/XBP1 axis activation. HeLa cells were treated 30min or 4h with thapsigargin (Tg, 400nM) in the presence or absence of guanabenz (GBZ, 50µM) or ISRIB (1ug/mL) prior to nuclei and RNA isolation for SNUPR profiling and transcriptional analysis of UPR-associated transcripts. **(A)** RT-qPCR analysis of XBP1 splicing as well as relative mRNA levels of XBP1s, XBP1tot, ATF6a and BLOC1S1 on HeLa cells treated with Tg in combination with ISRIB. Statistical analysis was performed using 2way ANNOVA test. **P* < 0.05, ***P* < 0.01, and ****P* < 0.001.

Supplemental Figure 7. Lineage-associated transcription factor staining allows SNUPR profiling on specific cell subsets on PBMC.

(A-C) Human Peripheral Blood Mononuclear Cells (PBMC) from 6 healthy donors were stained with surface markers (CD3, CD4, CD8, CD19, CD16, HLA-DR), permeabilized and stained intracellularly for nuclear markers (GATA3, PAX5, PU.1, BLIMP1, H3K27me3, BCL6) to identify cell subsets by FACS. **(A)** UMAP for PBMC was generated by using surface markers only. UMAPs coloured either by manually gated immune populations based on surface markers (left); or by nuclear marker expression levels (right panel). **(B)** Quantification of MFI for different nuclear markers on main immune populations. **(C)** Three gates were defined based on PU.1 and GATA3 expression levels for permeabilized cells. Stacked bars show the distribution of cells in these gates for each immune cell subset. **(D)** SNUPR profiling of PBMC. PBMCs were treated with thapsigargin (Tg, 400nM) for 30min or 4h in the presence or absence of guanabenz (GBZ, 50µM) prior to nuclear isolation. Nuclei identity was defined based on PU.1 and GATA3 expression (left). Translation levels and nuclear translocation of ATF6f and XBP1s was measured on isolated nuclei by FACS (right). MFI values were normalized to control treated samples. Statistical analysis was performed using 2way ANNOVA test. *P < 0.05, ** $P < 0.01$, and *** $P < 0.001$.

Supplemental Figure 8. Bortezomib induces UPR activation in leukemic and myeloma cells. Leukaemia cell lines and two multiple myeloma (MM) cell lines, LP1 and RPMI, were treated with the proteasome inhibitor bortezomib (BTZ, 100nM) for 2h, 4h and 6h prior to nuclei isolation and SNUPR profiling. **(A)** SNUPR profiles of translation levels and ATF6f and XBP1s nuclear translocation of cancer cells treated with BTZ for 2h, 4h or 6h. Statistical analysis was performed using Kruskall-Wallis test for each cell lines. **P* < 0.05, ***P* < 0.01, and ****P* < 0.001.

(B) Cell survival analysis of LP1 cells treated 6h with BTZ in presence or absence of IRE-1 inhibitor 4u8c (10uM). PERK inhibitor GSK2656157 (100nM) or a combination of both measured by flow cytometry. **(C)** Survival analysis of leukemia and multiple myeloma cells treated with a gradient concentration of BTZ in combination with a PERK inhibitor (GSK2656157. 100nM. blue). ATF6 inhibitor (Ceapin A7, 6uM orange) or IRE-1 inhibitor (4u8, green) for 24h. All analysis were performed by flow cytometry measurements of cell viability dye signals.

Supplemental Figure 9. IRE-1 inhibition affects ER chaperon expression on MM cells. (A) RT-qPCR analysis of ER chaperones and other UPR-associated transcript mRNA levels of LP1 and RPMI MM cell lines treated with BTZ (100nM) for 4h in the presence or absence of IRE-1 inhibitor 4µ8c (10µM). Statistical analysis was performed using two-way ANNOVA test. **P* < 0.05, ***P* < 0.01, and ****P* < 0.001.

Supplemental Figure 10. IRE-1 inhibition affects ER chaperon expression on MM cells. (A) RT-qPCR analysis of ER chaperones and other UPR-associated transcript mRNA levels of LP1 and RPMI MM cell lines treated with BTZ (100nM) for 4h in the presence or absence of IRE-1 inhibitor 4µ8c (10µM). Statistical analysis was performed using two-way ANNOVA test. **P* < 0.05, ***P* < 0.01, and ****P* < 0.001.

MATERIAL AND METHODS

Nuclear extraction

Prior nuclei extraction, the cells were stained with aqua dead from invitrogen for 20min on ice. Nuclei were extracted using EZ Prep (Sigma-Aldrich N3408) according to the commercial indication. Briefly, cells were harvested in 15mL tubes, washed with ice-cold PBS prior nuclei extraction and were centrifugated at 400g for 5 min at 4ºC. Supernatant were removed and the cells were resuspended with 1.5mL of EZ. Nuclear suspensions were incubated on ice for 5 min, pelleted at 500g for 5 min at 4°C. Nuclei were resuspended in 1.5mL EZ lysis buffer, incubated on ice for 5 min, and pelleted before resuspension in 200µL of PBS 2% PFA for 20min on ice. Nuclei were pelleted at 500g for 5 min at 4°C and resuspend in the storage solution and conserved at -80°C until permeabilisation steps.

Intracellular and nuclei staining for flow cytometry

Cells or nuclei were washed in cold PBS then fixed and permeabilized using FOXP3 fixation and permeabilization buffer (Thermofisher eBioscience) following manufacturer instructions. Cell and nuclei were blocked 10min at 4°C in blockage solution (Permeabilisation buffer 2%FCS) and stained with the following antibodies for 1h at 4°C in the dark (table 1). After incubation Nuclei were washed in FACS buffer prior flow cytometry analysis, on Canto II, LSR II UV BD cytometers and 5L Cytek Aurora spectral cytometer. The list of antibodies used can be found on Table 1.

Chemicals

4µ8c (SML0949), Ceapin A7 (SML2330), Bortezomib (5043140001), GSK2656157 (5046510001), rocaglamide (SML0656), and thapsigargin (T7458, 400nM), tunicamycin (SML1287, 100nM), KIRA6, cycloheximide were purchased from Sigma-Aldrich. Harringtonine fom ABCAM (ab141941).

Cell lines and culture

THP1, MOLT4, CAL1 and B-EBV cell lines were cultured in RPMI1640 . HELA and HEK293T were growth in DMEM . All growth medium have been supplemented with 10% FCS (Biosera). In addition, CAL-1 were grown in the presence of 10mM Hepes, 1mM of sodium pyruvate, 1X of glutamax, 1X non essential amino acids provide by Gibco. For THP1, MOLT4 CAL1 and B-EBV the percentage of FBS were decrease to 1% 16h prior thapsigargin (Tg) and tunicamycin (Tm) treatments. Adherent cells were first trypsinised then washed with ice cold PBS before nuclei extraction. Whereas suspension cells were directly harvested and washed in ice-cold PBS prior viability staining and nuclei extraction.

Quantitative PCR

Total RNA was extracted from cells using the RNeasy Mini Kit (QIAGEN). cDNA was synthesized using the Superscript II Reverse Transcriptase (Invitrogen) and quantitative PCR were paerformed with ONEGreen FAST qPCR Premix provide by Ozyme using 10µM of each specific primer on a 7500 Fast RealPCR system (Applied Biosystems). cDNA concentration in each sample was normalized to GAPDH expression. The primers used for gene amplification are depicted in the Primers table.

Immunoblotting

Cells were lysed in Triton buffer (20 mM Tris, pH 7.6, 10 mM NaCl, 1.5mM MgCl2; 1% Triton) supplemented with Complete Mini Protease Inhibitor Mixture Tablets (Roche), NaF (Ser/Thr and acidic phosphatase inhibitor), $N a_3 V O_4$ (Tyr and alkaline phosphatase inhibitor) and MG132 (proteasome inhibitor). Protein quantification was performed using the BCA Protein Assay (Pierce). Around 20 μg of soluble proteins were run in 10% acrylamide gels and for the immunoblot the concentration and time of incubation had to be optimized for each individual antibody. Rabbit antibodies against eIF2α, p-eEF2(Thr56), eEF2, eIF2B, p-IRF3 (ser396), IRF3, p-S6, and PERK were purchased from Cell Signaling (ref 5324, 2331, 2332, 3592, 4947, 4302, 2211, and 3192, respectively). Rabbit antibody against p-eIF2α(S51) was purchased from ABCAM (Ref 32157). Rabbit antibody against ATF4 was purchased from Santa Cruz Biotechnology (sc-200). Mouse antibody against β-actin was purchased from Sigma-Aldrich (A2228). Mouse antibodies against HDAC1 and S6 were purchased from Cell Signaling (ref 5356, 2317, respectively). Mouse antibody against puromycin was purchased from Merck Millipore (MABE343). Mouse antibody against p-eIF2β was a kind gift from David Litchfield (University of Western Ontario). Mouse antibody against eIF2β was purchased from Santa Cruz Biotechnology (sc-9978). HRP secondary antibodies were from Jackson ImmunoResearch Laboratories.

Immunofluorescence confocal microscopy

For immunofluorescence confocal microscopy, cells were seeded on coverslips, fixed with 3.3% PFA and permeabilized 5min with 0.1 % Triton X-100 or 0.05% Saponin. Before staining, samples were incubated with blocking buffer (PBS 1X, 5% FCS, 1% Glycine). Antibodies were added on samples in a wet chamber for 1h at RT or overnight at 4°C. Coverslips were washed in PBS three times before secondary staining. Samples were then washed in PBS and pure water prior glass mounting in ProLong™ Glass Antifade Mountant with nucleic stain (Invitrogen P36980).

Gene signature generation and MM patient stratification

Gene expression data were obtained from The Cancer Genome Atlas (TCGA) and other transcriptomic databases at diagnosis. We focused on the expression of genes regulated by XBP1, ATF6, and ATF4. The target genes were selected based on their association with these transcription factors as identified through chromatin immunoprecipitation (ChIP) assays and from QIAGEN IPA databases. **Patient Cohorts.** Patients were stratified into multiple myeloma cohorts based on their gene signature scores. The cohorts included patients from a bortezomib (BTZ) monotherapy trial, an anti-CD38 monotherapy trial, a cohort treated with dexamethasone monotherapy, and a treatment group receiving a combination of immunomodulatory drugs (IMiDs), dexamethasone (Dex), and high-dose melphalan followed by autologous stem cell transplantation. **Survival Analysis.** For survival analysis, we employed Kaplan-Meier estimates to evaluate the impact of gene signature-based stratification on overall survival and progression-free survival. MM Patients were divided into high and low expression groups based on a predefined cut-off point determined by the median expression of the target genes across the dataset. The differences in survival outcomes between these groups were assessed using the log-rank test to determine statistical significance. **Statistical Analysis:** All statistical analyses were performed using **Specify software**]. The significance level was set at a p-value of less than 0.05. Multivariate Cox proportional hazards models were used to adjust for potential confounders such as age, sex, and stage of disease.

Cytotoxicity assays

A total of 20,000 cells per well were seeded in 96-well plates using complete RPMI medium supplemented with 10% fetal calf serum (FCS). Cells were treated in triplicate with varying concentrations of bortezomib (catalog number 5043140001), 4µ8c (catalog number SML0949), Ceapin A7 (catalog number SML2330), and GSK2656157 (catalog number 5046510001). The treatments were administered to evaluate the combined cytotoxic effects under different drug concentration conditions. Cell viability was assessed at 24 and 48 hours post-treatment. A supra-vital viability dye, Zombie Yellow™ (1:200 dilution, catalog number 423103), was employed to stain dead cells. Following staining, the cells were washed thoroughly to remove excess dye and then subjected to flow cytometric analysis.

Statistical analysis

All statistics were done using Prism 9 software. The most appropriate statistical test was chosen according to each set of data, as indicated in figure legends with p values *p<0.05; **p<0.01; ***p<0.001; ****p<0.0001.

Table 1. Reagents & Resources

Table 2. Primers used

SNUPR

Inhibition of protein synthesis via PERK control the activation levels of the IRE-1/XBP1s and ATF6 pathway.

IRE-1 inhibitor kills bortezomib resistant cells and and XBP-1 associated transcriptional signatures predict the outcome of patients with multiple myeloma treated with Bortezomib.

D.

E.

Time (days)

supplemental Figure 1. Branch-specific UPR signatures correlate with survival prognosis of patients with Acute Myeloid Leukemia.

supplemental Figure 3. Quality control of nuclear extraction for SNUPR profiling

Figure 3. Induction of acute ER stress induces different UPR profiles in cell lines

B.

Figure 4. Translation arrest delays the activation of the IRE1/XBP1s and ATF6 pathway

A.

supplemental Figure 6. Translation inhibition delays IRE-1/XBP1s axis activation

supplemental Figure 7. Lineage-associated transcription factor staining allows SNUPR profiling on specific cell subsets on PBMC.

 $Tg(h)$

16 12

8

 \overline{A} $\mathbf 0$

CTRL GBZ

0 0.5 ⁴

0

 \mathcal{P}

 0.50

CTRL GBZ

 \circ 0.5 ⁴

 $\mathcal{O}^{\mathcal{O},\mathcal{O}}$ o

supplemental Figure 9. IRE-1 inhibition affects ER chaperone expression on MM cells.

Figure 6.

